

Dietary Alpha-Lactalbumin Alters Energy Balance, Gut Microbiota Composition and Intestinal Nutrient Transporter Expression in High-Fat Diet Fed Mice

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Abstract

Recently there has been a considerable rise in the frequency of metabolic diseases, such as obesity, due to changes in lifestyle and resultant imbalances between energy intake and expenditure. Whey proteins are considered as potentially important components of a dietary solution to the obesity problem. However, the roles of individual whey proteins in energy balance remain poorly understood. This study investigated the effects of a high fat diet (HFD) containing alpha-lactalbumin (LAB), a specific whey protein, or the non-whey protein casein (CAS), on energy balance, nutrient transporters expression, and enteric microbial populations. C57BL/6J mice ($n = 8$) were given a HFD containing either 20% CAS or LAB as protein sources or a low-fat diet (LFD) containing CAS for 10 weeks. HFD-LAB fed mice showed a significant increase in cumulative energy intake ($P=0.043$), without differences in body weight, energy expenditure, locomotor activity, respiratory exchange ratio or subcutaneous and epididymal adipose tissue weight. HFD-LAB intake led to a decrease in the expression of glucose transporter *glut2* in the ileum ($P=0.05$) and in the fatty acid transporter *cd36* ($P<0.001$) in both ileum and jejunum. This suggests a reduction of absorption efficiency within the small intestine in the HFD-LAB group. DNA from faecal samples was used for 16S rRNA-based assessment of intestinal microbiota populations; the genera *Lactobacillus*, *Parabacteroides* and *Bifidobacterium* were present in significantly higher proportions in the HFD-LAB group. These data indicate a possible functional relationship between gut microbiota, intestinal nutrient transporters and energy balance, with no impact on weight gain.

Introduction

Obesity has emerged as one of the most prevalent global health problems over the last 30 years because of its association with comorbidities such as chronic inflammations, type II diabetes, cardiovascular disorders and certain types of cancer⁽¹⁾. Whilst the aetiology of obesity is multifactorial, there is a growing recognition that high energy density diets (containing high levels of fat and sugar) are major contributors to long-term imbalance between energy intake and energy expenditure⁽²⁾, with comparable effects seen in rodents including mice such as the C57BL/6J strain. Indeed, energy dense diets increase intestinal energy absorption and fat storage in adipose tissue⁽³⁾. Additionally, these diets impair the hypothalamic regulation of hormones involved in the control of energy balance⁽⁴⁾. Thus, one approach to reducing weight gain or causing weight loss would be to devise interventions that affect the cross-talk between the gut, adipose tissue and the hypothalamic mechanisms regulating energy balance.

Nutrient digestion and absorption provides the necessary energy for the survival of living organisms and the gastrointestinal (GI) tract has evolved to optimise these processes⁽⁵⁾. In particular, nutrient absorption takes place in the duodenum, jejunum and ileum, through paracellular movements or by

uptake through specific nutrient transporters, which are able to transport fats (e.g., Fatty Acid Transporter, FATP4; Cluster Differentiation 36, CD36), sugars (i.e. Glucose Transporter 2, GLUT2; Sodium-Glucose transporter Protein 1, SGLT1) and amino acids (i.e. L-type Amino acid Transporter 4, LAT4; neural amino acid transporter 1, B⁰AT1) into the blood stream⁽⁶⁾.

The complexity of nutrient absorption is further highlighted by the network of diverse intrinsic and extrinsic factors regulating this process. With regard to intrinsic factors, it is notable that deficiency of the anorectic hormone leptin in mice⁽⁶⁾ increases energy ingestion leading to a greater adiposity and weight gain, coupled with associated hypothalamic-neuropeptide changes and chronic intestinal inflammation⁽⁷⁾. Similarly, targeted deletion of the gene encoding GLUT2, a key intestinal glucose transporter, also increases energy intake⁽⁸⁾.

Of the extrinsic factors, the gut microbiota plays a key role in harvesting energy from ingested food and providing it for host metabolism^(9; 10; 11; 12). Hence, germ free mice are protected against obesity despite consuming more calories than control mice, but this phenotype is reverted after faecal microbiota transplantation from conventionally raised mice⁽¹³⁾. Using gnotobiotic mice fed a high-fat or low-fat diet (HFD and LFD, respectively), a role has been suggested for *Clostridium ramosum* in the upregulation of body fat deposition promoting factors⁽¹⁴⁾. These data, coupled with the observed impact of gut microbiota on brain formation, including hypothalamic microstructures⁽¹⁵⁾, provide novel avenues for modulating the activity of the intestine, adipose tissue and hypothalamus, involving microorganisms.

Alpha-lactalbumin (LAB) is a globular protein well known as a source of peptides having beneficial properties such as antioxidant bioactivity and immune modulation ability⁽¹⁶⁾. It constitutes around 25% of the bovine milk whey proteins⁽¹⁶⁾. Whey can be extracted during the manufacture of cheese and comprises also other protein types, varying in abundances, including β -lactoglobulin (~ 65%), bovine serum albumin (BSA, ~8%), lactoperoxidase (0.25-0.5%), lactoferrin (Lf, ~1%) as well as other minor proteins such as immunoglobulins (<1%)⁽¹⁷⁾. Recently, whey proteins have been considered as a potential dietary solution to obesity in light of the discovery that these proteins, as an isolate (WPI) or concentrate (WPC), acutely increases the production of hormones that are involved in satiety in both humans and rodents^(18; 19). Moreover, intake of whey proteins in humans reduces fat absorption⁽²⁰⁾. This effect might be attributed to an altered composition of the gut microbiota involved in energy harvest, since other studies have shown that dietary whey proteins can influence the composition of the gut microbiota^(21; 22; 23; 24). Indeed, we showed that WPI reduced the proportion of Firmicutes in the mouse gut microbiome⁽²²⁾, and this was accompanied by a reduction in the expression of intestinal nutrient transporters, specifically *glut2* and *fatp4*. In addition, we showed that WPI reduced epididymal adipose tissue (eWAT) weight and overall body

weight gain. Consistent with changes in the gut, WPI increased energy intake, which was reflected in the altered hypothalamic gene expression of neuropeptides, namely proopiomelanocortin (*pomc*), neuropeptide Y (*npv*) and ghrelin⁽²²⁾.

While these data suggest a modulatory effect of WPI on the gut microbiome, hypothalamus and adipose tissue, it was not clear if the changes in energy intake were driven directly from the gut/hypothalamus axis or were secondary to the changes in adiposity. Indeed, previously it was shown that specific whey proteins, such as BSA and Lf, influenced in a different way body weight, energy intake and plasma leptin level^(25; 26).

Given that LAB has been shown to affect the energy balance but the underlying mechanism is still unclear^(27; 28), in the current study we sought to further investigate the link established previously between gut-hypothalamic-adipose control of energy balance using LAB as the main protein source. The protein was given in a physiological amount (i.e. 20% calories) during HFD-induced weight gain phase in the C57BL/6J strain of mice, which was used as the model for humans. LAB was introduced early in development (5 weeks of age), given WPI specificity to influence weight gain during this period⁽²⁹⁾. As the control, we fed mice a LFD or HFD containing the same physiological amount of a non-whey milk protein, casein.

Material and Methods

Experimental strategy

The *in vivo* experiments were approved by the University College Cork Animal Experimentation Ethics Committee (2011/005) and were licenced under the European Directive 2010/63/EU. Twenty-four C57BL/6J three week old male specific pathogen free mice were purchased commercially (Harlan; UK) and were singly housed in each cage with enrichment (Litaspen 8/20 and alpha-dry Plus bedding; LBS-biotech, UK) on a 12 h light/dark cycle with humidity maintained at 45-60% and temperature between 19-22°C. The mice had *ad libitum* access to food and water throughout the study unless otherwise stated. The health of the animals and the environment parameters were checked and recorded daily. No adverse effects were observed by the dietary interventions or procedures detailed below. The mice were provided with a diet containing 10% (low) fat and 20% casein (LFD-CAS; #D12450Bi; Research Diets, USA) (all % values by energy) during the initial 2 week acclimatisation period, and then weight matched mice were switched to a 45% (high) fat diet containing either 20% casein (HFD-CAS; #D12451i) or alpha-lactalbumin (HFD-LAB; #D13081701i) (n=8 per group). The controls continued to receive LFD-CAS (n=8).

The diets were OpenSource and were made by Research Diets, USA, with LAB sourced from Sigma, USA (diets composition details, Table S1). Body weight as well as food intake were measured weekly. The latter was converted to gross energy intake using the dietary energy density of the diets (HFD=19.79 KJ/g and LFD=16.11 KJ/g; Research Diets, USA).

During weeks 8 and 9, mice were placed in TSE Phenomaster cages (Germany) for 3 days to measure metabolic parameters, specifically, oxygen consumption (ml/h, VO₂), carbon dioxide production (ml/h, VCO₂), respiratory exchange ratio (VCO₂/VO₂, RER) and locomotor activity (X, Y and Z planes). The data were collected in the final 24h of the housing period as detailed previously⁽³⁰⁾.

At week 10, mice were fasted for 10-12h commencing at 22.00 in the dark phase, then anaesthetized (100mg/Kg Ketamine and 10 mg/Kg Xylazine) and blood samples were collected. Mice were sacrificed by cervical dislocation and tissues were collected and samples were stored at -80°C for subsequent analysis. The length of the small intestine and the weight of all the tissues were recorded on fresh tissues before snap freezing them.

DNA Sequencing

Faecal samples were collected directly from the colon, homogenized and processed using mechanical and chemical lysis. The 16S rRNA gene (V3-V4 region) was amplified with Universal primers (PCR1 Forward and Reverse primer as to the Illumina 16S Metagenomic Sequencing Protocol) that facilitated sequencing on the Illumina MiSeq platform (2x250bp paired-end reads; V3 sequencing chemistry). The fastq files were filtered on the basis of quality (removal of low quality nucleotides at the 3' end) and length (removal of sequences with less than 200nt) with prinseq⁽³¹⁾, and paired reads with a minimum overlap of 20 bp were joined using Fastq-join⁽³²⁾.

Sequences were clustered (97% identity) to obtain Operative Taxonomic Units (OTUs) using closed-reference usearch v7.0 algorithm⁽³³⁾ and chimeric OTUs were removed through use of the gold database. The taxonomic assignment of OTUs was obtained using the Ribosomal database project (RDP)⁽³⁴⁾. Alpha and beta-diversity was determined using QIIME⁽³⁵⁾, and additional analyses were performed with the R package phyloseq⁽³⁶⁾.

To identify chow-associated microbes, total DNA was extracted from ~ 10 g of chow containing 20% fat and 20% casein (LFD-CAS; #D17052702; Research Diets, USA), and ~ 10 g of chow containing 40% fat and 20% casein (HFD-CAS; #D17052705; Research Diets, USA) using the Gene All Extragenic SoilSV kit (GeneAll). The Qubit high-sensitivity DNA assay (Bio-Sciences, Dublin, Ireland) was used for accurate quantification of the total DNA. Whole-metagenome shotgun libraries preparation was performed following the Nextera XT DNA library preparation guide from

171 Illumina⁽³⁷⁾ and sequencing was performed using the Illumina NextSeq 500 with a v2 NextSeq
172 500/550 high-output reagent kit (300 cycles).

173 The raw shotgun metagenomic sequences were filtered on the basis of quality (removal of low
174 quality nucleotides at the 3' end and application of sliding window trimming, cutting once the
175 average quality within the window falls below a threshold quality of 20 bp) and length (removal of
176 sequences of less than 200nt) with prinseq⁽³¹⁾. The filtered sequences were then converted to bam
177 files using SAMtools⁽³⁸⁾, and duplicate reads were subsequently removed using Picard Tools
178 (<https://github.com/broadinstitute/picard>). The quality of the sequences was tested using SAMtools
179 in combination with Picard Tools, removing the low quality sequences. Taxonomic analysis was
180 performed using Kaiju⁽³⁹⁾.

181 **Gene expression**

182 The small intestine samples, stored at -80°C, were initially immersed in a RNAlater-Ice frozen
183 tissue transition solution and stored at -20°C according to the instructions of the manufacturer
184 (Ambion). This step allows untangling of the intestine while preserving the integrity of the RNA so
185 that tissue samples, corresponding to the ileum (1 cm from the distal end of the small intestine) and
186 jejunum (the central part of the small intestine), could be cut.

187 Total RNA was extracted from the intestinal samples and hypothalamic blocks using RNeasy
188 Minikit and QIAshredder columns (Qiagen), and from epididymal adipose tissue (eWAT) and
189 subcutaneous adipose tissue (sWAT) using QIAzol Lysis Reagent (Qiagen). The extracted RNAs
190 were treated with DNase (Qiagen, Ireland). Complementary DNA was synthesized from 600ng total
191 RNA using SuperscriptTM II Reverse Transcriptase kit (Life Technologies, Ireland), and subjected
192 to Real-Time PCR (Roche, Ireland) using SYBR Green Select Master Mix (Roche, UK) as detailed
193 before⁽⁴⁰⁾. The gene expression was calculated using $2^{-\Delta\Delta C_p}$ and normalised against the reference
194 gene β -actin (intestine and adipose tissue) and YWAZ (hypothalamus). The sequence of the primers
195 can be found elsewhere^(25; 30; 40).

196

197 **Plasma leptin, glucose and triglyceride levels**

198 Plasma leptin and glucose levels were determined using Mouse Leptin ELISA kit (Crystal Chem,
199 USA) and Mouse Glucose Assay (Crystal Chem, USA) respectively. Triglyceride (TAG) level in
200 the plasma was measured using Triglyceride Quantification Assay Kit (abcam, UK).

201

202 **Statistical analysis**

203 For power calculation, the coefficient of variation was measured using data (body weight gain)

from a previous study⁽⁴⁰⁾ and determined to be 8.8%. For a power of 80% and a significance level of 5%, this allows detection of a difference of 14% with a sample size of 8 mice per treatment. Body weight and energy intake differences over 10 weeks were analysed by a two-way repeated-measures ANOVA with Bonferroni's *post hoc* pairwise comparisons. Statistical analysis of gene expression, cumulative energy intake, intestine weight/intestine length, plasma leptin and triacylglycerol data were performed using one-way ANOVA followed by pairwise comparison using Bonferroni's *post hoc* test. Non-parametric data were compared by Kruskal-Wallis ANOVA followed by Mann-Whitney *U* test. Data were expressed as mean \pm SEM and significance was set at $P < 0.05$ using SPSS software version 24 (IBM Corp). V_{O_2} and heat production was analysed by ANCOVA (SAS software version 9.3), with total body weight being used as the covariant.

Gut microbiota data were statistically analyzed by Adonis and Anosim for beta-diversity analysis. ANOVA was used to calculate significance for alpha-diversity-related analyses (statistical significance established at $P < 0.05$). Statistical differences across multiple samples were determined by Kruskal-Wallis and False discovery rate (FDR, *q*value) control based on the Benjamini-Hochberg procedure, used to correct for multiple testing with the R statistical package (<https://www.r-project.org/>). Test for association across all groups of samples were performed through correlation analysis. This was based on Spearman's rank correlation test by the R function of *cor.test*, which aimed to examine similar expression association profiles between groups of samples (<https://www.r-project.org/package=corrplot>) and adjustment of the *P*value by the Benjamini-Hochberg method. Statistical significance was established at $P < 0.05$ (*), with other ranges, i.e. $P < 0.01$ (**) and $P < 0.001$ (***), also being noted.

Results

LAB increased cumulative energy intake but not weight gain

Mice fed HFD-LAB and HFD-CAS had similar body trajectories (Fig. 1A) but differed from the LFD-CAS group in the time taken to increase weight. Notably, the HFD-CAS group had a significantly higher weight than LFD-CAS by week 3 ($P = 0.033$) while the weight of the HFD-LAB group did not significantly exceed that of the LFD-CAS group until week 6 ($P = 0.045$) ($F_{(8,160)} = 440.2$, $P < 0.001$ for the effect of the Time, $F_{(2,20)} = 5.5$, $P < 0.05$ for the effect of the Diet, $F_{(16,160)} = 11.6$, $P < 0.001$ for the effect of the Time x Diet interaction) (Fig. 1A). Despite having similar body weight trajectories, the energy intake of HFD-LAB showed a trend towards an increase at week 2 ($P = 0.053$) (413 \pm 9 kJ in HFD-LAB, 383 \pm 8 kJ in HFD-CAS and 293 \pm 8 kJ in LFD-CAS) and it was higher in HFD-LAB compared to HFD-CAS at week 4 ($P = 0.037$) ($F_{(7,140)} = 7.2$, $P < 0.001$ for the effect of the Time, $F_{(2,20)} = 81.7$, $P < 0.001$ for the effect of the Diet, $F_{(14,140)} = 1.3$, $P > 0.05$ for the effect of the Time x Diet interaction) (Fig. 1B). The cumulative energy

intake of HFD-LAB was significantly increased by week 10 relative to HFD-CAS ($P=0.043$) (Fig. 1C). The difference in energy intake was reflected in the hypothalamic expression of neuropeptides. Notably, at week 10, the expression of the anorexigenic neuropeptide *pomc* was reduced relative to the LFD-CAS control ($P=0.043$ compared to HFD-CAS and $P=0.001$ compared to HFD-LAB), without showing significant difference between the two HFD groups. (Fig. 1D). While the gene expression for the orexigenic neuropeptides ghrelin and *npv* remained unchanged, the gene expression of growth hormone secretagogue receptor (*ghsr*) was reduced in both HFD groups compared to LFD-CAS ($P=0.012$ relative to HFD-CAS and $P=0.001$ relative to HFD-LAB) (Fig. 1D). Similar to *pomc* expression, the expression of *ghsr* between HFD-CAS and HFD-LAB groups did not change. There was no effect due to diet on the expression of the fatty acid synthase (*fasn*). The mismatch between energy intake and weight gain was unrelated to energy expenditure as both HFD-CAS and HFD-LAB groups had similar 24h VO_2 levels (97 ± 3 in HFD-LAB, 95 ± 3 in HFD-CAS and 101 ± 3 in LFD-CAS; all values in ml/hr) and heat production (2.1 ± 0.05 in HFD-LAB, 2.0 ± 0.05 in HFD-CAS and 2.2 ± 0.06 in LFD-CAS; all values in kJ/hr), where both parameters were measured during week 8 and 9 period. There were no differences between groups in terms of 24h locomotor activity (303 ± 28 in HFD-LAB, 293 ± 29 in HFD-CAS and 365 ± 37 in LFD-CAS). While the HFD-CAS and the HFD-LAB groups had similar RER, the corresponding values were lower compared to LFD-CAS (both with $P < 0.001$), consistent with increased fat consumption by former groups (0.816 ± 0.014 in HFD-LAB and 0.809 ± 0.014 in HFD-CAS versus 0.916 ± 0.008 LFD-CAS).

LAB decreases the intestinal expression of glucose and fatty acid transporters

To find an explanation for the apparent energy loss in the HFD-LAB group, the impact on gastrointestinal size and related gene expression of several nutrient transporters were measured. The intestinal length was unaffected by the diet (33.2 ± 0.61 cm in HFD-LAB, 32.4 ± 0.74 cm in HFD-CAS and 32.9 ± 0.38 cm in LFD-CAS). While the intestinal weight expressed relative to the length and body weight was similar between HFD-CAS and HFD-LAB groups, this was significantly lower compared to LFD-CAS controls ($P=0.039$ relative to HFD-CAS and $P=0.019$ relative to HFD-LAB) (Fig. 2A). The data from ANCOVA analysis showed that there was not significant effect of diet on intestinal weight/length when body weight was used as a covariant (0.024 ± 0.001 g in HFD-LAB, 0.025 ± 0.001 g in HFD-CAS and 0.026 ± 0.001 g in LFD-CAS).

In the ileum, we observed a significant decrease in the expression of the sodium-glucose transporter protein (*sugt1*) in both high fat groups compared to the LFD-CAS ($P=0.026$ relative to HFD-CAS and $P=0.029$ relative to HFD-LAB), but *glut2* gene expression was specifically reduced in the HFD-LAB compared to LFD-CAS ($P=0.01$) and it showed a trend towards a decrease, at the

significance threshold, compared to HFD-CAS ($P=0.053$) (Fig. 2B). While *fatp4* gene expression was unaffected in the ileum, the cluster of differentiation 36 (*cd36*; an integral membrane protein responsible for importing fatty acids into the cell) was reduced in the HFD-LAB compared to the LFD-CAS ($P=0.001$) and HFD-CAS ($P<0.001$) (Fig. 2B). The expression of genes encoding the L-amino acid transporter, *lat4*, and the neutral amino acid transporter *slc6a19* was not significantly affected (Fig. 2B).

The same gene expression was measured in the jejunum. Similar to the ileum data, *cd36* gene expression in the jejunum was reduced in the HFD-LAB group compared to the other two groups ($P=0.001$ relative to LFD-CAS and $P<0.001$ relative to HFD-CAS), whereas *glut2* expression did not change across the groups (Fig. 2C). In addition, in the jejunum, the level of expression of *fatp4* was significantly higher in the HFD-LAB group compared to the LFD-CAS control group ($P<0.001$) and the expression of *lat4* showed a trend towards an increase in the HFD-LAB fed mice relative to HFD-CAS fed mice ($P=0.061$) (Fig. 2C).

In light of the results obtained for *glut2* and *cd36* gene expression, we measured the levels of glucose and triglyceride in the plasma. We observed that the glucose in the plasma of HFD-LAB fed mice (311 ± 23 mg/dL) was not significantly different to HFD-CAS (293 ± 8 mg/dL) but was lower compared to LFD-CAS fed mice (364 ± 8 mg/dL, $P=0.018$). The level of triglyceride in the HFD-LAB (37 ± 4 mg/dL), HFD-CAS (35 ± 6 mg/dL) and LFD-CAS (36 ± 5 mg/dL) groups was not significantly different.

LAB does not affect leptin gene expression and plasma hormone availability

Several tissues were harvested from the mice and their weights were recorded (Fig. 3A). The weights of both the subcutaneous adipose tissue (sWAT) and the eWAT were greater in both the HFD groups compared to the LFD-CAS control group (sWAT: $P=0.002$ relative to HFD-CAS and $P=0.056$ relative to HFD-LAB; eWAT: $P=0.001$ relative to HFD-CAS and $P<0.001$ relative to HFD-LAB) but there were no differences in the adipose tissues weights between HFD-CAS and HFD-LAB (Fig. 3A). Next, the expression of several genes involved in the catabolism and anabolism of fatty acids in the eWAT and sWAT was measured. In the current study, the expression in the eWAT of genes involved in fatty acid catabolism (carnitine palmitoyltransferase I, *cpt1*; uncoupling protein, *ucp*; hormone-sensitive lipase, *hsl*; beta-3 adrenergic receptor β -3ar) and anabolism (acetylCoA carboxylase 1, *acc1*; fatty acid synthase, *fasn*; lipoprotein lipase, *lpl*) between HFD-LAB and HFD-CAS fed animals did not differ (Fig. 3B-C). There was also no change in the expression of genes involved in fatty acids transport, such as *cd36*, *fatp1* and *glut4* (Fig. 3C). However, consistent with the increased adiposity of the high fat fed groups, *acc1* gene

expression was down regulated in HFD-CAS ($P=0.008$) and HFD-LAB ($P=0.002$) compared to LFD-CAS (Fig. 3C). In addition, the inflammatory marker, cluster of differentiation 68 (*cd68*) expression showed a trend towards an increase in the HFD-CAS group compared to the LFD-CAS ($P=0.057$), but for the HFD-LAB group, the increase was not significant relative to LFD-CAS (Fig. 3C). The unchanged adipose tissues weights, coupled with gene expression data in the eWAT, suggests an alternative mechanism of energy loss in the HFD-LAB group. We also measured leptin (*ob*) gene expression in the eWAT to assess if there is a specific effect of LAB in leptin regulation, similar to that attributed to the whey protein Lf⁽²⁶⁾.

Consistent with the gain in body weight and adipose tissue weight, the expression of the *ob* gene in the HFD-CAS group increased compared to the control LFD-CAS ($P<0.001$) and, in the HFD-LAB group, it showed a trend towards an increase relative to the LFD control ($P=0.059$), without showing any differences between the two HFD groups ($P=0.08$) (Fig. 3C).

Similarly, no differences in *ob* expression were detected in the sWAT between the HFD groups (Fig. 3E), and the expression of *fasn* and *glut4* genes were decreased compared with the LFD-CAS group (*fasn*: $P=0.001$ relative to HFD-CAS and $P=0.001$ relative to HFD-LAB; *glut4*: $P=0.021$ relative to HFD-CAS and $P=0.035$ relative to HFD-LAB), with no difference between HFD-CAS and HFD-LAB groups (Fig. 3E).

The *ob* gene expression in eWAT and sWAT was reflected in the plasma availability of leptin, as the presence of LAB in the HFD did not influenced the plasma hormone level, relative to HFD-CAS (Fig. 3D).

Beta-diversity and gut bacterial composition differs due to LAB intake.

After quality filtration and length trimming an average of 182,494 high-quality 16S rRNA sequences per sample (i.e., faecal pellets collected from the colon) were obtained across two groups, i.e., HFD-CAS ($n=8$) and HFD-LAB ($n=8$). Analysis of this data revealed that, while alpha-diversity did not differ significantly across groups, a significant difference in beta-diversity ($P=0.002$) between the microbiota of the HFD-CAS and HFD-LAB animals was apparent, as represented by distinct clustering upon Principal Coordinates Analysis (PCoA) of all 16S rRNA reads (clustered at 97% similarity) (Fig. 4A).

Differences in beta-diversity were reflected by taxonomic differences between the HFD-CAS and HFD-LAB groups. At the phylum level, a lower Firmicutes/Bacteroidetes (ratio F/B) was apparent in the HFD-CAS samples (ratio F/B=1.23) relative to the HFD-LAB equivalents (ratio F/B=1.42), though significance was not achieved (Fig. 4B). At the family level, two families differed

significantly in a diet-associated manner. These were *Lactobacillaceae* (higher levels in HFD-LAB samples) and *Streptococcaceae* (higher proportions in HFD-CAS samples) (Table 1).

At the genus level, statistically significant differences were apparent in the abundance of *Parabacteroides*, *Bifidobacterium*, *Parvibacter* and *Lactobacillus*, all of which were present in higher proportions in the HFD-LAB sample groups, as well as *Lactococcus*, *Roseburia* (P=0.021), *Phascolarctobacterium* (P=0.018) and *Turicibacter*, present in higher proportions in the HFD-CAS group (Table 1), were noted.

To assess the possibility that the presence of particular taxa within the chow containing CAS could be responsible for the associated increased proportion of *Streptococcaeae* in the gut, analysis of the microbiota of the CAS-containing chow was performed. This revealed that the family *Streptococcaceae* (99.6% and 99.8% in LFD-CAS and HFD-CAS chow, respectively) and the associated genus, *Lactococcus* (99.6% and 99.8% in LFD-CAS and HFD-CAS chow, respectively), were dominant (Table S2).

Correlation and independent analyses of expression association profiles were conducted between *cd36* and *glut2* expression levels, as well as energy intake, against bacterial composition at the genus level. Dairy taxa potentially sourced from the food substrate were not considered. After adjustment for multiple testing (BH-corrected), it was noted that energy intake positively correlated within the group of HFD-CAS samples with *Parabacteroides*. Within the HFD-LAB group, *Parabacteroides* negatively correlated with *cd36* expression. *Glut2* expression was positively correlated with *Parabacteroides* in HFD-LAB samples (Fig. 4C).

Discussion

In this study, we investigated the effects of a specific dietary whey protein (LAB) on intestinal-adipose-hypothalamic control of energy balance. We show that supplementation of LAB in a HFD reduced *cd36* and *glut2* gene expression in the intestine and was associated with changes in the composition of the gut microbiota. These changes were accompanied by increased cumulative energy ingestion. This, coupled with the fact that targeted deletion of the *glut2* gene increases energy intake⁽⁸⁾, suggests a potential link between gut microbiota, intestinal nutrient transporters and energy intake in response to LAB supplementation. These effects were unrelated to adiposity, as HFD-LAB fed mice had similar weight gain, adipose tissue weight (both eWAT and sWAT) and plasma TAG.

Previous studies have shown that diets rich in whey proteins cause short-term satiety effects in mice and in humans^(41; 42; 43). Long term effects on energy balance, however, do not involve the production of satiety hormones⁽¹⁹⁾. On a background of HFD intake, which has been shown to reduce the brain sensitivity to satiety hormones⁽⁴⁴⁾, the increased energy intake in mice fed with HFD-CAS compared to LFD and even higher (cumulative) energy intake in HFD-LAB is likely to involve another mechanism of regulation within the adipose tissue-gut-brain connection.

Hypothalamic neuropeptide expression provided an insight into the regulatory effect of LAB on energy intake. Notably, the expression of the anorexigenic neuropeptide *pomc* gene expression was significantly lower in the HFD-CAS group in line with the higher energy intake compared to LFD-CAS, similar to that shown in previous studies^(26; 30). In the HFD-LAB group, while *pomc* expression remained low, the expression of the orexigenic neuropeptide, *npv*, did not change across the groups. In contrast, effects on energy intake and on hypothalamic *pomc* and *npv* expression were previously found in mice fed with WPI compared to casein in a LFD⁽²²⁾. In addition, neither the expression of *npv* nor the cumulative energy intake changed in mice fed a HFD containing lactoferrin compared to casein⁽²⁶⁾. These data suggest that the whey protein LAB have bioactivity that influences energy intake and that is not mediated by the modulation of hypothalamic neuropeptide genes investigated in this study.

In the current study, while the HFD-CAS group increased weight rapidly, reaching a significant increase relative to LFD values by week 3, it was a further 3 weeks before the mice fed HFD-LAB diet significantly increased body weight relative to LFD fed animals. The finding that the higher cumulative energy intake was not reflected in the increased body weight in the HFD-LAB group suggests a mechanism must exist to explain the missing energy from the supply. This is consistent

with a rat study, which showed that HFD intake with LAB did not change energy intake but decreased adiposity⁽²⁷⁾. The difference in energy intake between this study and our current study could be related to the fact that the rat study included both egg albumin and LAB as the protein sources in the same diet, whereas we used LAB as the only protein source. This apparent energy loss could be related to lipid oxidation, as a recent study showed that pre-exercise LAB-enriched whey protein meal preserved lipid oxidation alongside rapid delivery of amino acids to tissues for use during exercise, decreasing the adiposity in rats⁽⁴⁵⁾. However, we did not observe this effect in the sedentary mice used in our current study, as RER was similar between HFD-LAB and HFD-CAS fed mice and adipose-specific gene expression linked to lipid catabolism also did not change. This, coupled with the similar sWAT and eWAT weights between HFD-LAB and HFD-CAS groups, suggests that the energy loss in the sedentary mice fed LAB occurs through another mechanism.

It has been shown previously that WPI reduces fat absorption in humans and mice^(29; 46; 47), and we showed that this effect could be related to decreased ileal *fatp4* gene expression⁽²²⁾. In addition, we also showed a time course reduction of *glut2* gene expression in the same region with 17 weeks of WPI intake and this effect on intestinal gene expression was independent of sucrose content in the diet⁽²²⁾. In the present study, by feeding a constituent protein of WPI, i.e. LAB, to mice for a shorter time period (10 weeks) and by analysing their intestinal gene expression, we now observed a reduction in the expression of *sglt* in both HFD groups relative to LFD groups. This can be a reflection of higher carbohydrate content in the LFD compared to the two HFDs (Table S1). In addition, we show a reduction of *glut2* expression in the ileum exposed to HFD, specifically with LAB. The similar effects of LAB and WPI on intestinal *glut2* expression in the ileum suggests that LAB may contribute to the bioactivity in WPI influencing *glut2* expression and this bioactivity, whatever it may be, appears to be effective independent of sucrose or fat content in the diet⁽²²⁾. It was shown that the recruitment of apical GLUT2 in the small intestine is detrimental for health, i.e., it leads to an excess of glucose uptake with increased obesity and type 2 diabetes risk⁽⁴⁸⁾. Our study suggests a potential effect of a diet enriched in LAB in the control of intestinal glucose transporter-related transcripts, that could influence glucose absorption. In another *in vitro* study, using human intestinal Caco-2 cells, it was shown that polyphenols can also lead to a decrease in the abundance of apical GLUT2⁽⁴⁹⁾.

In the current study, we observed also a reduction in *cd36* gene expression within both ileum and jejunum. Thus, in combination, these data further support the hypothesis the whey protein LAB

seems to affect different components of the mechanism involved in the absorption of glucose and fatty acids within the small intestine, at least at the gene expression level. This would explain, at least in part, the loss of energy that occurs in mice fed LAB. Further analysis aimed to look at the protein level and energy content in the faeces need to be done to confirm this hypothesis. Notably, differences in the level of *cd36* and *glut2* in the jejunum during LAB intake are in agreement with the fact that the modality and the degree of absorption can change along the intestinal tract. This is due to a different density of nutrient transporters across the three major regions of the small intestine⁽⁵⁰⁾. Based on the effect of LAB in a HFD on expression of nutrient transporters in the intestinal epithelium and associated energy loss, we speculate that mice compensate by increasing energy intake. In fact, in this study we observed that the levels of glucose and triacylglycerol in the plasma did not show significant changes between HFD groups.

Furthermore, the HFD groups consumed more energy than LFD. Since there were no differences in the energy expenditure, the energy surplus has been stored in the adipose tissue. Thus, the lower expression of *acc* and *fasn* in the adipose tissue, presumably reflects the reduced necessity to produce fat endogenously when there is an external supply of excess energy. A similar reduction in *fasn* gene expression has been noted in a previous study from our group⁽²¹⁾. On the contrary, other studies show that HFD intake increases *fasn* and *acc* in the adipose tissue^(51; 52; 53). The reasons for these discrepancies are unclear, but we speculate that contributing factors can include different genetic background, age, diet (composition and duration) and different housing environment.

Leptin, a hormone encoded by the *ob* gene, controls food intake and body weight through an interaction with specific receptors within the hypothalamus⁽⁵⁴⁾. In obese humans and in mice fed an obesogenic diet the adipose tissue mass increases, enhancing significantly the level of serum leptin and leading to metabolic dysfunctions⁽⁵⁵⁾. In addition to the effect on intestinal nutrient transporters and energy intake, WPI in a LFD also reduced eWAT weight and plasma leptin, raising the possibility that the reduced adipose tissue and associated signals, including reduced leptin, could have stimulated the energy intake in mice. However, feeding mice with a HFD containing 20% of WPI for 8 weeks did not have an effect on plasma leptin levels, compared to mice fed a HFD containing CAS⁽³⁰⁾. On the contrary, HFD containing lactoferrin significantly reduced plasma leptin levels compared to the HFD-CAS controls⁽²⁶⁾. This is another demonstration of the distinct bioactivities that WPI-associated whey proteins can have. In this study, mice fed a HFD containing LAB as the sole protein source showed no significant decrease in plasma leptin, which was

reflected in no change in eWAT and sWAT *ob* gene expression in the HFD-LAB group, compared to the HFD-CAS group.

We also demonstrated that a HFD containing LAB has a strong influence on the composition of the gut microbiota. Beta-diversity data highlighted differences in the clustering of samples from the HFD-LAB group compared to the HFD-CAS group. Corresponding taxonomic analyses were also completed. In particular, we observed a significantly higher proportion of *Parabacteroides* in the HFD-LAB group, which is notable in that this genus showed a significantly positive correlation with the expression of nutrient transporters. Notably other studies have suggested that *Parabacteroides* protects the gut from inflammation and there have been reports of the apparent absence of this genus in the digestive tract of people affected by Inflammatory Bowel Diseases^(56; 57). We also observed that the genera *Bifidobacterium* and *Lactobacillus* are significantly more abundant in the HFD-LAB group. In several human studies, an association between lower levels of *Bifidobacterium* and obesity was noted^(58; 59; 60). In addition, higher levels of *Bifidobacterium* have been linked with an increase in SCFA production, an improvement of gut mucosal barrier and lower intestinal LPS levels^(60; 61). Furthermore, specific strains of *Bifidobacterium* and *Lactobacillus* spp. have been shown to exhibit anti-obesity effects⁽⁶²⁾. It is worth highlighting the importance of species and strain level differences as, for example, human and animal studies have highlighted an association between different *Lactobacillus* species with weight gain or weight protection^(63; 64). For this reason, more accurate in-depth metagenomic analyses, such as shotgun analysis, should be considered in the future to investigate the *Lactobacillus* species that populate the gut of HFD-LAB fed mice.

A number of bacterial taxa typically associated with dairy products were also found to be altered in the gut. A recent human feeding study demonstrated that many bacteriophages and *Streptococcus* and *Lactococcus* genera, that were significantly altered in individuals whose diet was supplemented with whey proteins, were present in high proportions within the whey protein supplement⁽⁶⁵⁾, and thus presumably originated from the food source. The family *Streptococcaceae* and the associated genus, *Lactococcus*, are significantly more abundant in the HFD-CAS group compared to the HFD-LAB group. This is consistent with our previous study that showed that *Streptococcaceae* proportion increased significantly in the CAS-fed mice compared to WPI-fed mice⁽²²⁾. However, this phenomenon is likely a reflection of the high proportion of *Streptococcaceae* and *Lactococcus* reads detected after analysis of both LFD-CAS and HFD-CAS chows.

The changes in the gut microbiota in the presence of LAB, coupled with the reduced intestinal expression of genes for nutrient transporters, support and provide a potential scenario for the energy

mismatch in the HFD-LAB group compared to the control group. However, the specific mechanism that connects these changes in intestinal transporters gene expression, gut microbiota and energy intake in the presence of LAB remains to be elucidated. Further studies are needed to assess if these effects are seen with different genetic background, sex, housing environment (group versus single housing) and dietary fat content and duration. In conclusion, this present study has demonstrated for what is to our knowledge the first time, how a HFD containing a specific whey protein, i.e. LAB, specifically affects the metabolism, microbiota and nutrient absorption regulation, without preventing weight gain and adipose tissue mass accumulation in mice.

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Conflict of Interest

None.

Authorship

The author contributions are as follows: K. N. N., P. D. C., J. R. S. and J. F. C. designed the study; S. B. and K.N.N. performed the experiments; R. C. R. carried out the bioinformatics analyses; S.B., K.N.N. and R.C.R generated the figures. All authors contributed to the drafting of the manuscript. All the authors approved the final version for submission.

Family	HFD-LAB vs HFD-CAS	Relative Abundance
<i>Streptococcaceae</i>	P=0.029 ↑ HFD-CAS	0.082895775
<i>Lactobacillaceae</i>	P=0.015 ↑ HFD-LAB	1.18133309
Genus		
<i>Lactococcus</i>	P=0.001 ↑ HFD-CAS	0.077810661
<i>Turicibacter</i>	P=0.024 ↑ HFD-CAS	0.301261529
<i>Streptococcus</i>	P=0.001 ↑ HFD-LAB	0.148479572
<i>Parvibacter</i>	P=0.039 ↑ HFD-LAB	0.012092907
<i>Lactobacillus</i>	P=0.011 ↑ HFD-LAB	1.180503082
<i>Parabacteroides</i>	P=0.026 ↑ HFD-LAB	0.045986668
<i>Bifidobacterium</i>	P=0.05 ↑ HFD-LAB	0.159330093

Table 1

Table 1: Relative abundance (%) of genera and families in which their abundance is significantly higher either in the HFD-CAS group or in the HFD-LAB group. Statistical differences across multiple samples were estimated by the bioinformatics methods “False discovery rate” control based on the “Benjamini-Hochberg” procedure

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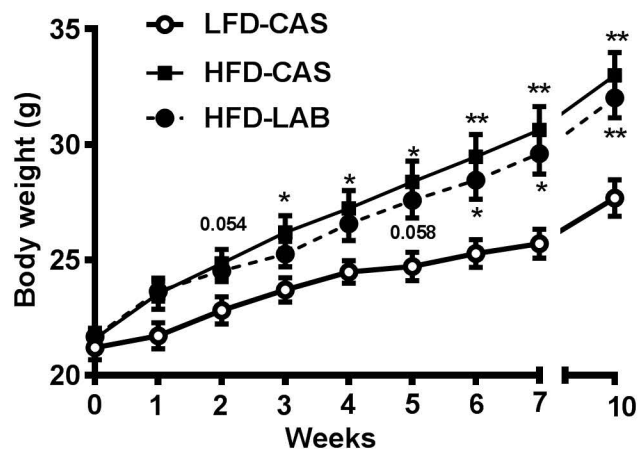
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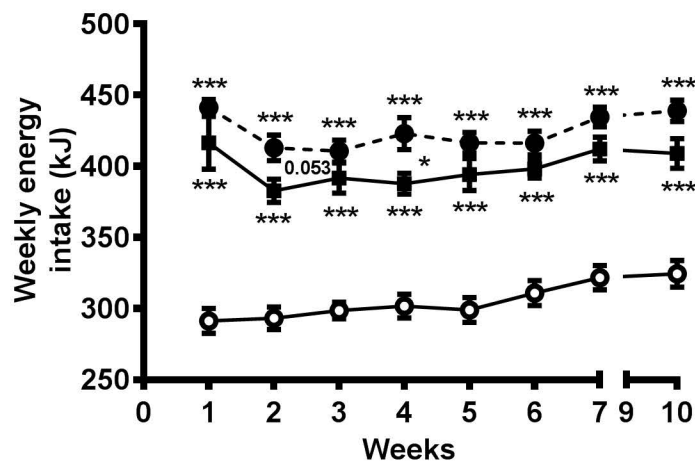
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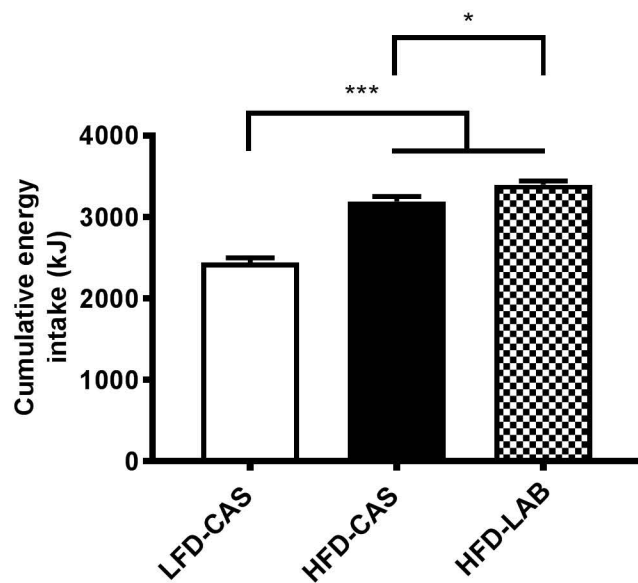
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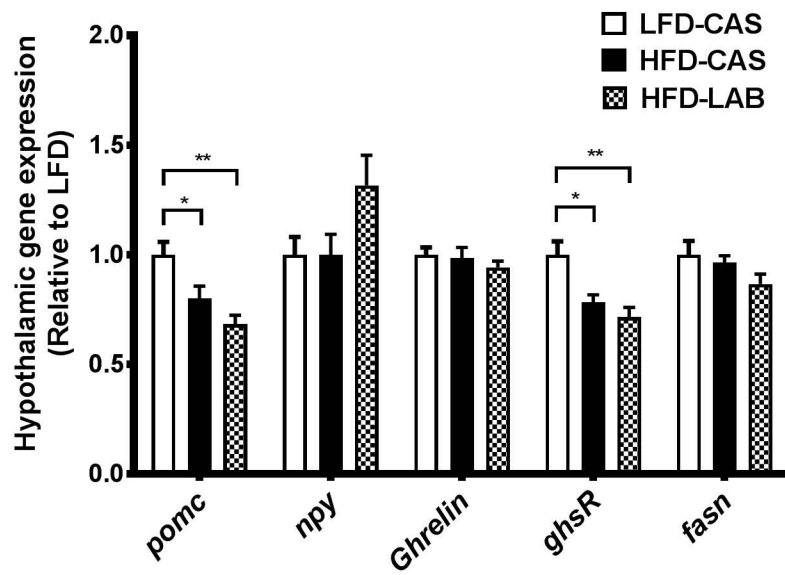
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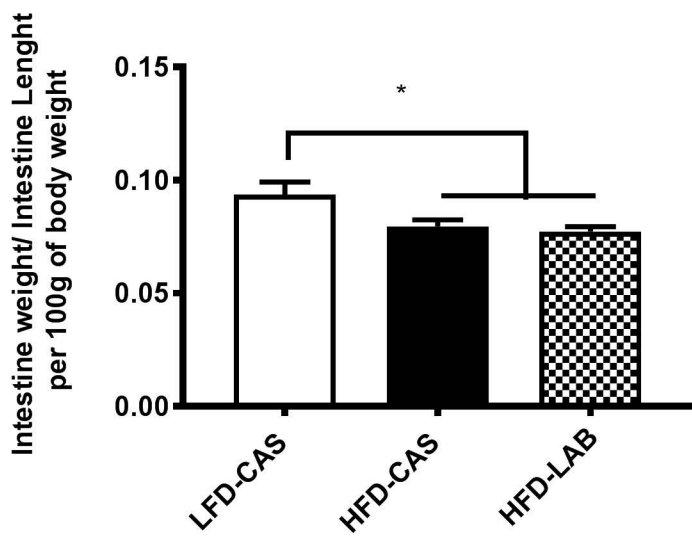
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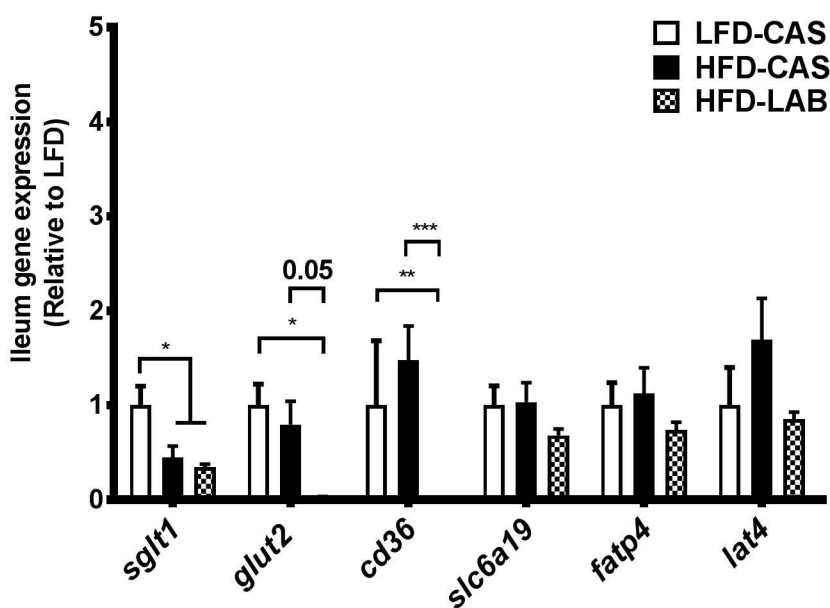
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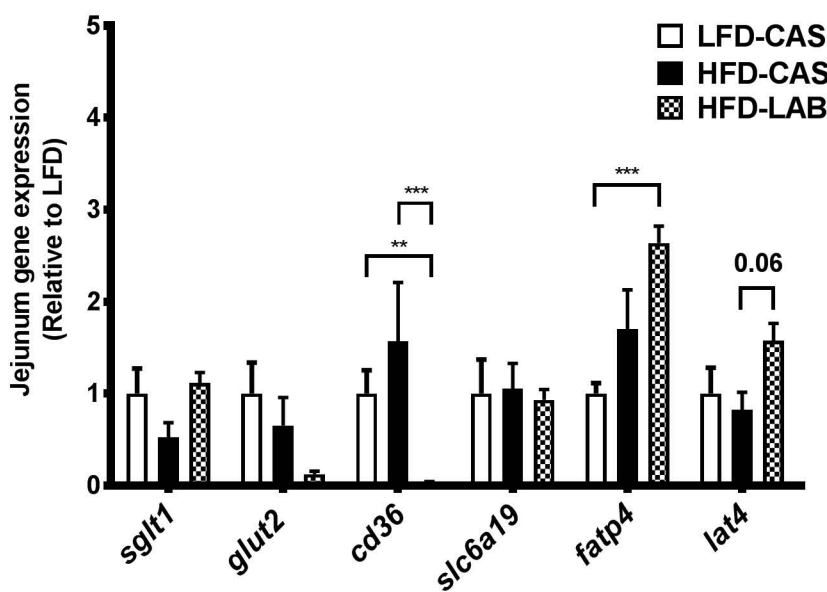
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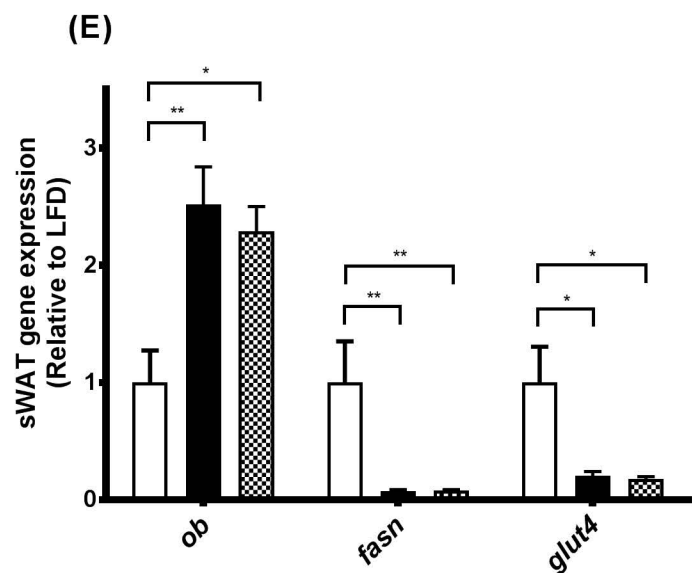
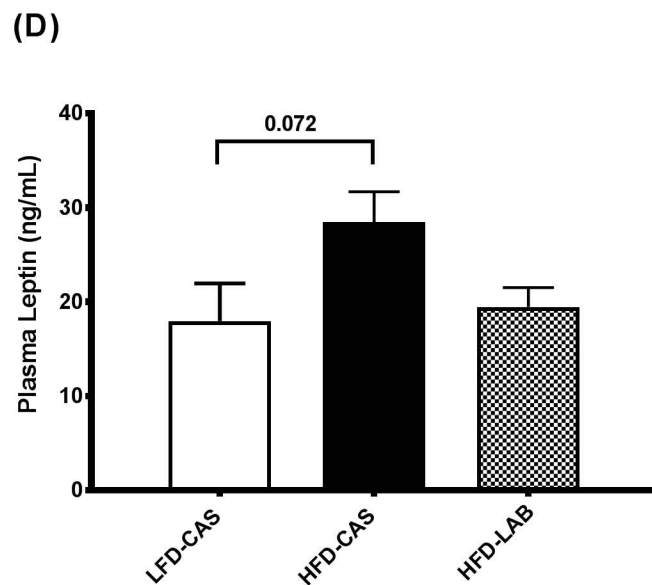
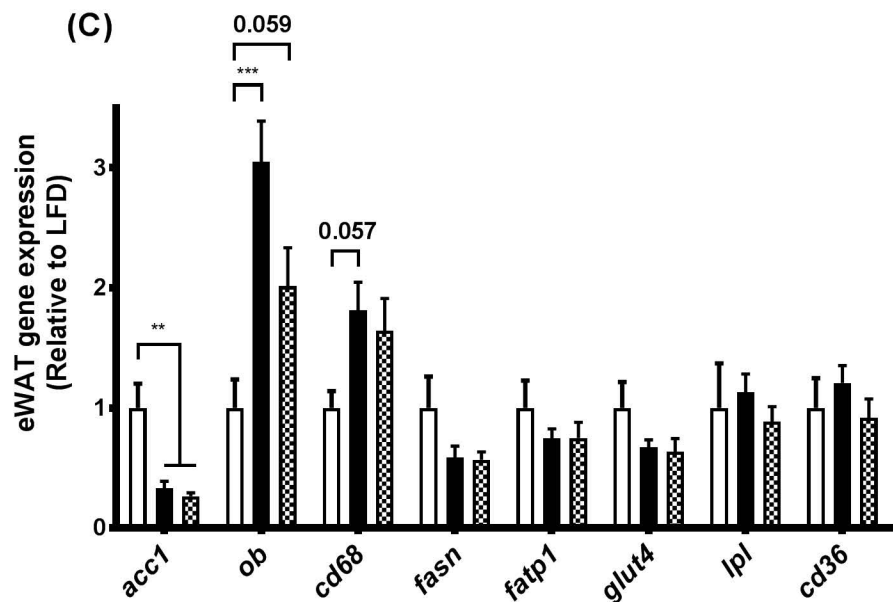
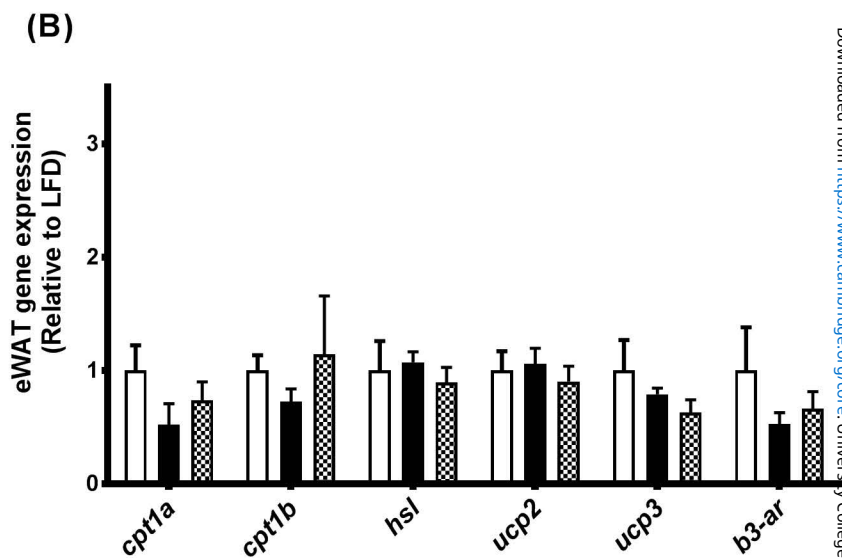
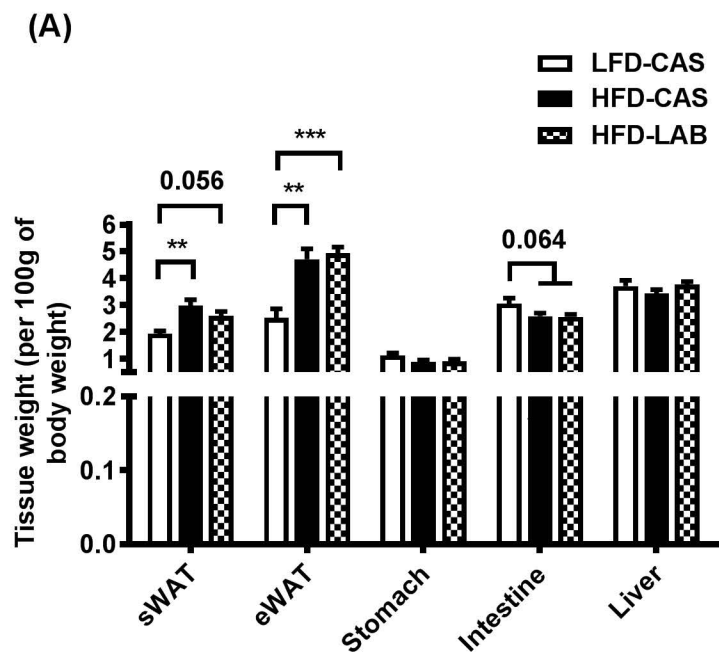


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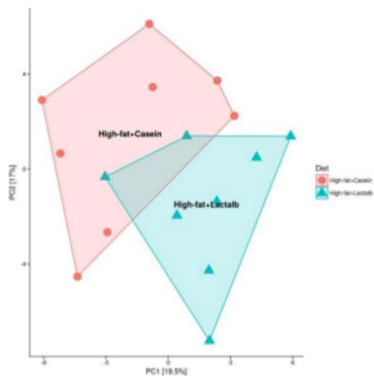


(C)

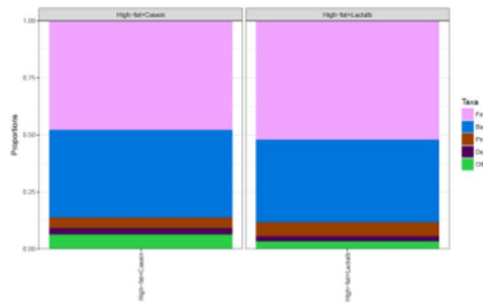




(A)



(B)



(C)

